

1   **Reliability of sleep deprivation-associated spontaneous brain activity and**  
2   **behavior**

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30

31 **Abstract**

32 Recent studies have indicated that sleep deprivation (SD) alters intrinsic low-frequency  
33 connectivity in the resting brain, mainly focusing on the default mode network (DMN) and its  
34 anticorrelated network (ACN). These networks hold key functions in segregating internally and  
35 externally directed awareness. However, far less attention has been paid to investigation of the  
36 altered amplitude of these low-frequency fluctuations (ALFF) at the whole-brain level and more  
37 importantly by what extent the sleep-deprived resting brain pattern can be reproducible and  
38 predict individual behavioral performance. The aim of this study was to characterize more  
39 clearly the influence of sleep on the whole brain level of ALFF changes and its relation with the  
40 performance of a lexical decision task in the sleep deprivation. Sixteen healthy participants  
41 underwent fMRI three times: once after a normal night of sleep in the rested wakefulness (RW)  
42 state and two following approximately 24 h of total SD separated by an interval of two weeks  
43 (SD1 and SD2). Our behavioral results showed that sleep stabilizes performance whereas two  
44 sleep deprivation even at an interval of two weeks consistently deteriorates it. Sleep deprivation  
45 attenuated the ALFF mainly in the bilateral orbitofrontal cortex (OFC), bilateral dorsolateral  
46 prefrontal cortex (DLPFC) and right inferior parietal lobule (IPL). By contrast, the enhanced  
47 ALFF emerged in the left sensorimotor cortex (SMA), visual cortex and left fusiform gyrus.  
48 Conjunction analysis of SD1 and SD2 versus the control maps and voxel-wise ICC analysis  
49 revealed that these SD induced ALFF changes showed a significantly high reliability ( $ICC > 0.5$ ).  
50 Particularly, the attenuation of the right IPL presents a significant negative relation with the  
51 behavior performance and can be reproducible for two SD at an interval of two weeks. Our  
52 results suggest that ALFF is a stable measure in study of SD, and the right IPL may represent a  
53 stable biomarker that responds to sleep loss.

54

55 **Keywords:** sleep deprivation, resting-state fMRI, ALFF, test-retest, reliability

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## 60 Introduction

61 Sleep deprivation (SD) repeatedly show a variable (negative) impact on mood, cognitive  
62 performance, and motor function due to increasing sleep propensity and destabilization of the  
63 wake state (Goel et al., 2009). Previous neuroimaging studies have shown that insufficient sleep  
64 can have a number of adverse effects on brain functioning. The investigation of the neural  
65 mechanism underlying SD by using fMRI is still in the initial stage, but has already provided a  
66 wealth of information about sleep-deprived brain networks and various functions that support  
67 normal waking behavior. Various neuroimaging studies have found altered activation patterns of  
68 sleep-deprived brain during a number of tasks including memory (Chee and Choo, 2004; Chee et  
69 al., 2006; Mu et al., 2005; Mu et al., 2005; Sterpenich et al., 2009; Van Dongen, 2005), attention  
70 (Chee and Tan, 2010; Chee et al., 2008; Kong et al., 2012), executive functioning (Drummond  
71 and Brown, 2001; Muto et al., 2012), and decision making (Chee et al., 2010; Kong et al., 2011;  
72 Libedinsky et al., 2011). Several brain regions, such as the prefrontal cortex, parietal cortex,  
73 sensorimotor area, visual cortex, thalamus and cingulate cortex have been frequently reported to  
74 be associated with SD.

75

76 Prolonged wakefulness has been associated with altered functional integrations in the  
77 resting brain. The default mode network (DMN), with a relatively high rCBF (Gusnard et al.,  
78 2001; Raichle et al., 2001) and a high level of correlated BOLD signal fluctuations (Greicius et  
79 al., 2003; Raichle, 2011) at rest, is considered to support self-awareness (Gusnard et al., 2001)  
80 and conscious self-representation (Lou et al., 2004). Investigations of the influence of SD on the  
81 DMN had shown significantly disrupted deactivations and led to double dissociations within  
82 anterior as well as posterior midline regions of the DMN (Gujar et al., 2010). This finding invites  
83 the speculation that the decreased DMN connectivity could be intrinsic to the sleep deprivation  
84 or a reflection of changes in vigilance (De Havas et al., 2012; Samann et al., 2010). In addition,  
85 the DMN is anticorrelated with the cognitive control network (CCN), a corresponding  
86 task-positive network, which encompasses bilateral fronto-cingulo-parietal structures including  
87 lateral prefrontal and superior parietal areas (Niendam et al., 2012). Abnormal connectivity  
88 within DMN and its anticorrelated networks (CCN) have also been reduced after SD (Bosch et  
89 al., 2013; De Havas et al., 2012; Samann et al., 2010; Shao et al., 2013). DMN-CCN interactions

90 may be considered to reflect the level of consciousness that is required for information  
91 integration (Heine et al., 2012; Larson-Prior et al., 2011). More recently, two studies pointed out  
92 that enhanced functional connectivity between the dorsal nexus and dorsolateral prefrontal cortex,  
93 as well as attenuated functional connectivity within thalamocortical, also occurs after a SD  
94 (Bosch et al., 2013; Shao et al., 2013). These findings indicate disrupted temporal  
95 synchronization of the global resting-state network in the sleep-deprived brain. However, these  
96 investigations generally adopted the seed-based functional connectivity method and did not  
97 allow for a direct assessment of regional activity during the resting brain. In other words,  
98 abnormal functional interactions between two remote areas cannot address the question on which  
99 area is responsible for such observable connectivity alternations.

100

101 In light of this view, we aimed to measure the amplitude of low-frequency fluctuation  
102 (ALFF) in sleep-deprived resting brain. ALFF, without a priori selection of regions of interest,  
103 can be used to study the dynamics of the BOLD signal at the local, voxel-wise level, without  
104 assessing the relationship between regions (Zang et al., 2007). In addition, such method has  
105 proven to be test-retest reliability across time (Li et al., 2012; Turner et al., 2012; Yan et al.,  
106 2013; Zuo et al., 2010), and can successfully predict magnitudes of the task-evoked activity  
107 (Mennes et al., 2011; Zou et al., 2013). The present study attempted to address the following  
108 issues: *i*) by which way sleep-deprived brain reflects abnormal patterns of ALFF; *ii*) whether  
109 such patterns are reproducible over a two-week interval SD; *iii*) to what extent the inter-subject  
110 differences in the ALFF resting activity may predict individual behavioral performance. For this  
111 purpose, a lexical decision task was also used as a paradigm to test the effects of sleep loss and  
112 fatigue on the dynamic time-course of responses to cognitive load (Babkoff et al., 1985; Forster  
113 and Forster, 2003; L O Pez Zunini et al., 2014).

114

## 115 Materials and Methods

### 116 Subjects

117 Sixteen healthy volunteers (8 females, mean age of  $22.1 \pm 0.8$  years) were recruited in this  
118 study after giving the informed consent. Participants were selected from respondents to a  
119 web-based questionnaire. They should meet the following criteria: (1) right-handed according to

120 the modified Edinburgh Handedness Questionnaire ([Oldfield, 1971](#)); (2) between 20 and 24  
121 years of age; (3) good sleeping habits (sleeping no less than 6.5 h each night for the past one  
122 month); (4) not be of extreme morning or evening chronotype ([score no greater than 22 on a](#)  
123 [modified Morningness–Eveningness scale; Horne and Ostberg, 1976](#)); (5) no long-term  
124 medications; (6) no symptoms associated with sleep disorders; (7) no history of any psychiatric  
125 or neurologic disorders; (8) no history of drug abuse and current use of anti-depressant or  
126 hypnotic medications. Participants had an average of  $15.7 \pm 1.2$  years of education. This study  
127 was approved by the medical research ethics committee and institutional review board of The  
128 First Affiliated Hospital of Nanchang University.

129 Participants showed normal sleep quality as assessed using the Pittsburgh Sleep Quality  
130 Index (PSQI) [[37](#)] (mean $\pm$ SD,  $1.5 \pm 0.97$ ) and normal daytime sleepiness as assessed using the  
131 Epworth Sleepiness Scale (ESS)[\[38\]](#) (mean $\pm$ SD,  $6.44 \pm 2.07$ ). They had a BMI (in kg/m<sup>2</sup>) of  
132 17.5–22, and were free of nightshift work. Before experiment (approximately 4 weeks before),  
133 subjects were required to sleep 7–9 h/night, preceding 00:10 a.m on average and keep sleep logs.  
134

### 135 *Sleep deprivation and experimental protocol*

136 All subjects were scheduled for three fMRI scans starting at 7:00 PM. One scan follows the  
137 individual's normal sleep (RW group), while the other two after a night of total SD (i.e., SD1  
138 and SD2 groups). Two SD sessions were approximately two weeks apart. The sequence of  
139 experiments was counterbalanced across sessions and approximately two weeks apart between  
140 two experiments. This was to ensure minimizing the possibility of residual effects of SD on  
141 cognition in participants whose SD session preceded their rested wakefulness session. Subjects  
142 were forbidden to tea, coffee or caffeine content drinks and alcohol intake for 72 h before fMRI  
143 examinations. Sleep logs were kept for a week prior to the study night. During SD, subjects were  
144 monitored in the lab onward and only allowed to engage in non-strenuous activities such as  
145 reading and watching videos. Vigorous physical activity prior to the scans was forbidden.  
146

147 A behavior test was performed for each subject prior to fMRI scanning. Word stimuli were  
148 displayed using the experimental software DMDX v.3.0.4 ([Forster and Forster, 2003](#)).  
149 White-color words of 10 mm in size were presented on monitor with a black background in a

150 dimly lit room. During the experiment, each pair of stimuli was presented for 900 ms separated  
151 by a blank screen for 500 ms. Subjects had 2,500 ms between trials to judge whether the two  
152 words were semantically related or not. A positive response was indicated by pressing the right  
153 button using the middle finger of the right hand, while a negative response was represented  
154 corresponding left button to the index finger of the right hand. Participants were encouraged to  
155 proceed as quickly and accurately as possible. Accuracy and reaction times (RTs) (to the nearest  
156 millisecond) were recorded. Before the formal test, a short period of practice with a different set  
157 of sentences was provided.

158

### 159 *Data acquisition*

160 fMRI data were collected on a SIEMENS Trio 3.0 T scanner. Each subject lied on supine  
161 with the head in neutral position fixed comfortably by a belt and foam pads during the test. The  
162 scanning sessions included: (1) localizer, (2) T1 MPRAGE anatomy (176 sagittal slices,  
163 thickness/gap = 1.0/0 mm, in-plane resolution = 256 × 256, FOV (field of view) = 240 mm × 240  
164 mm, TR (repetition time) = 1,900 ms, TE (echo time) = 2.26 ms, flip angle = 15 °), (3)  
165 EPI-BOLD (36 axial slices, echo-planar imaging pulse sequence, thickness/gap = 5.0/1 mm,  
166 in-plane resolution = 64 × 64, TR = 3,000 ms, TE = 30 ms, flip angle = 90 °, FOV = 240 mm ×  
167 240 mm). During the resting-state fMRI session, subjects were required to be as calm as possible,  
168 to keep their eyes closed but not to fall asleep to ensure a successful image acquisition.

169

### 170 *Behavioral analysis*

171 To examine changes in behavior performance over the course of the SD sessions, the mean  
172 RT and false rates (button pressed following a cue) to measure the accuracy of performance were  
173 computed respectively.

174

### 175 *Data preprocessing*

176 All preprocessing was performed using the Data Processing Assistant for Resting-State  
177 fMRI (DPARSF, Yan and Zang, 2010, <http://www.restfmri.net>), which is based on Statistical  
178 Parametric Mapping (SPM8) (<http://www.fil.ion.ucl.ac.uk/spm>) and Resting-State fMRI Data  
179 Analysis Toolkit (REST, Song et al., 2011, <http://www.restfmri.net>). For the resting-state fMRI

180 data on each subject, the first two volumes were discarded to avoid the possible effects of  
181 scanner instability and adaptation of subjects to the circumstances.

182

183 The following sequence of preprocessing steps was performed: *i*) slice timing (correction  
184 for the within-scan acquisition time differences between slices); *ii*) head motion correction  
185 (realignment and a six-parameter spatial transformation). Recent studies indicate that head  
186 motion can significantly influence measures and results derived from the resting-state  
187 fMRI([Power et al., 2012; Van Dijk et al., 2012; Yan et al., 2013](#)), we computed the  
188 voxel-specific head motion, including voxel-specific framewise displacement ( $FD_{vox}$ ) and  
189 voxel-specific total displacement ( $TD_{vox}$ ) values for each subjects by using the DPARSF toolbox.  
190 Group differences of mean  $FD_{vox}$  were calculated by using two-sample t-test while with no  
191 significant group differences. Then the mean FD was used as a covariate in the group  
192 comparisons of ALFF. In our study, absolute head movement was below 0.5 mm and 0.5 ° for all  
193 subjects; *iii*) spatial normalization to the Montreal Neurological Institute (MNI) template  
194 (resampling voxel size =  $3 \times 3 \times 3$  mm<sup>3</sup>); *iv*) spatial smoothing (full width at half maximum  
195 (FWHM) = 6 mm Gaussian kernel); *v*) linear detrend and voxel-wise bandpass filtering (0.01 -  
196 0.08 Hz).

197

198 For ALFF analysis, for a given voxel, the time series was first converted to the frequency  
199 domain (0.01-0.1Hz) using a Fast Fourier Transform (FFT). The square root of the power  
200 spectrum was computed and then averaged across a predefined frequency interval. This averaged  
201 square root was termed ALFF at the given voxel. ALFF measures the absolute strength or  
202 intensity of LFF. ALFF of each voxel was computed for each participant and was further divided  
203 by the global mean value to reduce the global effect of variability across participants.

204

#### 205 *Test-retest reliability analyses*

206 Test-retest reliable measurements are important for the inference of convincing conclusions.  
207 To investigate the test-retest reliability of SD, we further calculated voxel-wise intraclass  
208 correlation coefficients (ICC) between two SD sessions ([Zuo et al., 2010](#)).

209

210 *Statistical analyses*

211 We used paired *t*-test for SD vs. RW groups to determine the effects of SD on performance  
212 measures of RT. For ALFF, a one-sample one-sided *t*-test was performed inter-group to  
213 determine whether the ALFF differed from 1 (Raichle et al., 2001; Zang et al., 2007), and a  
214 paired *t*-test to see the differences between groups. Voxels with a *p* value < 0.01, cluster size >  
215 1,053 mm<sup>3</sup> (39 voxels) were considered to be a significant statistical difference between two  
216 groups, which also corresponds to a multiple corrected *p*<0.05 in the AlphaSim program  
217 (<http://afni.nih.gov/afni/docpdf/AlphaSim.pdf>).

218

219 *Conjunction analysis*

220 A conjunction of SD1 and SD2 versus control maps was calculated to determine brain areas  
221 that commonly and similarly differently in both SD1 and SD2.

222

223 *Brain-behavior relationships*

224 To further evaluate the relationship between ALFF changes and behavioral performance  
225 after SD, we examined the Pearson's correlation between the mean ALFF values of peak voxels  
226 of areas derived from the inter-group comparison and behavioral performance of RT.

227

## 228 **Results**

229 *Performance findings*

230 There were no significant differences in the accuracy rate between the SD and RW groups.  
231 The two SD groups had significantly longer reaction time than that of the RW group (RW =  
232 2,010.4 ± 227.17 (ms), SD1 = 2,275.1 ± 176.66 (ms), *T* = -3.858, d.f. = 15, *P* < 0.002; SD2 =  
233 2,172.2 ± 166.51 (ms), *T* = -2.584, *p* < 0.021) (Fig. 1).

234

235 *ALFF differences in two SD sessions*

236 Comparing with the RW group, both SD groups showed the decreases of ALFF mainly in  
237 the bilateral orbitofrontal cortex (OFC) (BA 11/47), bilateral dorsolateral prefrontal cortex  
238 (DLPFC) (BA 46) and right inferior parietal lobule (IPL, BA39/40), while the increases of ALFF

239 emerged primarily in the somatosensory cortex (SMC), fusiform gyrus (BA 37) and middle  
240 occipital gyrus (MOG) (BA 18/19) ([Fig. 2](#) and [Table.1](#)).

241

#### 242 *Conjunction analysis and voxel-wise ICC analysis*

243 The overlap of SD1 and SD2, compared to control group, shared the same areas primarily in  
244 the Pcu/PCC, OFC, SMC, bilateral occipital cortex, and right IPL (shown in [Fig. 3](#)). The high  
245 reliability derived from the intra-subject test-retest analysis existed in most of brain areas (ICC  
246  $\geq 0.5$ , Fig.3). These areas mainly located at the precuneus /PCC, cingulate cortex, bilateral SMC,  
247 bilateral parietal cortex, bilateral MPFC, and bilateral occipital cortex.

248

#### 249 *Correlations between ALFF and behavior performance in the SD group*

250 In this study, the greater the prolongations in the RT from rest to SD, the greater the  
251 decrease in ALFF in the right IPL reproducible by two SD at an interval of two weeks (for SD1,  
252  $r = -0.561, p < 0.024$ ; while for SD2,  $r = -0.499, p < 0.05$ ) ([Fig.4](#)).

253

## 254 **Discussion**

255 Several observations emerged from the examination of spontaneous “low frequency”  
256 fluctuation from temporal synchronization (i.e. functional connectivity) in sleep-deprived resting  
257 brain. Beyond verifying the altered intrinsic patterns in “off-line” brain, we noted that even one  
258 night of sleep loss can alter the ALFF, especially attenuations in the bilateral OFC, bilateral  
259 DLPFC, and right IPL, while enhancements in the SMC, thalamus, fusiform gyrus and visual  
260 cortices. Moreover, the measurements of the ALFF patterns in the sleep-deprived brain are quite  
261 reliable over time with an interval of two weeks. These relatively high stability coefficients  
262 provided conservative estimates of the test-retest reliability of ALFF in SD. In addition, the  
263 inter-subject differences in ALFF measures provide a clue to predict the individual behavioral  
264 performance, which showed a significantly negative relation of RT with the ALFF of the right  
265 IPL.

266

267 Significantly different patterns of ALFF were found between SD and RW. Consistent with  
268 previous task-evoked activations in varied cognitive stimuli, our findings showed that altered

269 ALFF changes were mainly located in the DLPFC, OFC and IPL. It is believed that the  
270 frontal-parietal areas are particularly vulnerable to SD (Bosch et al., 2013; Chee and Tan, 2010;  
271 Chuah et al., 2010; Lythe et al., 2012). Decreased activities in the prefrontal and parietal were  
272 especially found in several working memory studies, therefore parietal activity represents a  
273 biomarker of individual response to sleep debt (De Havas et al., 2012). Inadequate sleep is also  
274 associated with exaggerated emotional responses (Chuah et al., 2010; Goldstein et al., 2013;  
275 Killgore, 2013; Menz et al., 2012; Minkel et al., 2012; Mullin et al., 2013). The OFC, known as  
276 the limbic system, is thought to be critical for mediating the interactions between emotional  
277 processes and cognitive functions, such as decision making (Azzi et al., 2012; Kahnt et al., 2012;  
278 Parsons et al., 2013; Zald et al., 2012). We speculate that SD may influence emotion and  
279 cognition regulation circuitry, and lead to deficient capacity to regulate emotional arousal and  
280 cognitive loads.

281

282 Besides impairments in sleep-deprived resting brain, it was also worthy to note that  
283 enhanced ALFF mainly emerged in the SMC, fusiform gyrus and visual cortex, which may  
284 reflect compensation mechanism after sleep loss, and an attempt to maintain hyperarousal. Early  
285 PET and fMRI studies investigate brain responses to attention tasks following SD, and also find  
286 such hypermetabolism in the visual cortex and sensorimotor areas (Thomas et al., 2000). They  
287 inferred that such an enhancement of brain activity might indicate a homeostatic drive for  
288 recovery of brain areas involved in attention and higher-order cognitive processes, interpreted as  
289 compensatory mechanisms to maintain alertness and cognitive performance in the face of  
290 extended wakefulness. A recent study of enhanced functional connectivity between primary  
291 sensory processing and motor planning regions in insomnia provides further evidence, consistent  
292 with our results (Killgore et al., 2013). This may imply ALFF encodes tendency for task  
293 response even during the resting state.

294

295 As expected, we found highly reproducible ALFF patterns at a two-week interval in the  
296 sleep-deprived brain. The overlapped areas presented in our study included the PCC, OFC, IPL,  
297 SMC, visual cortex and right insula via the conjunction analysis. Voxel-wise ICC map showed  
298 the spatial distribution of the reliability of the observed ALFF, mainly along the midline

299 structure of the brain, lateral prefrontal and parietal cortex ( $p < 0.001$ ). This finding was in line  
300 with previous task-fMRI research (Lim et al., 2007), which has shown reproducible brain  
301 activations highly correlated across sessions in a frontoparietal network during a working  
302 memory task. As in previous studies, stable drop in the left parietal activation over time, we  
303 denoted that these tasks-evoked brain activity and behavior changes may underlie intrinsic brain  
304 activity. The reliability of the resting spontaneous activity pattern, acting as a functional  
305 framework for a moment-to-moment responses, remains uncovered. In the present study, we  
306 confirmed its stability over a two-week interval. Along the same lines, some studies also found  
307 reliability of the ALFF in chronic schizophrenia (Turner et al., 2012) and healthy state (Li et al.,  
308 2012) during a short period of time. This may support the notion that, in a relatively short  
309 duration, intra-individual resting dynamics to SD load stably exists.

310

311 At resting state, the brain featured by exhibiting an intrinsic organization that includes both  
312 “task-negative” (DMN) and its anticorrelated “task-positive” networks (ACN) (Fox et al., 2005).  
313 DMN characterized by more energetic metabolic and neural activity at rest engaged in internally  
314 focused tasks, such as autobiographical memory retrieval, implicit learning, prospection,  
315 monitoring and other internally focused thought processes (Braga et al., 2013; Raichle et al.,  
316 2001; Uddin et al., 2009). Decreased ALFF signals in the PCC, bilateral OFC (BA 11/47) and  
317 right inferior parietal lobule (IPL, BA39/40) following 24h SD may be associated with  
318 maladaptive ability to switch the default mode activity when task conditions required attentions.  
319 The DLPFC, one of the “task-positive” regions (ACN), has been implicated to be responsible  
320 for the failure in working memory in SD (Goel et al., 2009). In our study, reduced DLPFC  
321 activity may suggest dysfunctional integrations between the DMN and ACN, and this is  
322 consistent with reduced anti-correlation between DMN and ACN nodes during both task and  
323 resting states (De Havas et al., 2012). Moreover, the interesting finding is the increased ALFF in  
324 the SMC, visual cortex and left FG. According to the sleep homeostatic hypothesis (Born and  
325 Feld, 2012; Tononi and Cirelli, 2003, 2006), one possible explanation may be the compensatory  
326 reallocates—the resting brain reallocate its oscillatory dynamics resources. This reconfiguration  
327 reduces the adaptation of neural resources in response to increased cognitive challenges and  
328 emotion regulations.

329  
330       The results obtain reproducible behavior performance following the SD at an interval of two  
331 weeks. Besides the reliability, there is a significant negative linear correlation between the ALFF  
332 decrease in the right IPL and RT when performing lexical decision task. Plentiful studies have  
333 found that sleep loss can significantly degrade performance on tasks that incorporate a  
334 working-memory component or that otherwise are thought to require contributions from  
335 frontoparietal cortical regions (Goel et al., 2009). The IPL, as an important association area of  
336 integrating sensory information, plays a prominent role in visuospatial attention. Successful  
337 performance of the semantic priming tasks demands participants to sustain mental effort,  
338 strategically control and quickly focus their attention in order to accurately register transient  
339 stimulus events, as well as rapidly compare incoming information to that maintained in working  
340 memory. In this study, the significantly negative linear correlation may suggest that spontaneous  
341 activity of the IPL was impaired with sleep loss load. Many reports, though some divergent, are  
342 associated reduced task-evoked parietal activation with a decline in behavioral performances.  
343 One recent study from resting functional connectivity also support the notion that activity  
344 changes in the IPL may reflect the early effects of SD (De Havas et al., 2012). Therefore, it is  
345 reasonable to suggest that reduced resting state intrinsic activity in the IPL may relate to  
346 declining cognitive capacity in SD.

347

## 348 **Limitations**

349       There are several limitations in this study. Firstly, a relatively small sample, the statistical  
350 power lowers and limited, so the results can hardly survive a strict multiple comparison  
351 correction (e.g. FDR or FWE correction). Future studies could use a larger sample size to  
352 increase the statistical power of the study. Secondly, a lack of objective assessment of both  
353 self-reported sleepiness and mood items. Further investigations should be focused on a more  
354 detailed frequency-dependent analysis.

355

## 356 **Conclusion**

357       Our high test-retest reliability of ALFF patterns highlighted the notion that sleep burden  
358 reshapes the low frequency dynamics in the resting brain, and this sleep-deprived brain pattern

359 can predict the individual behavior performances. This finding may provide much deeper  
360 insights into the understanding of SD related underlying neurological underpinnings of cognitive  
361 declines.

362

### 363 **Conflict of Interests**

364 There is no competing interest.

365

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529 Table 1. Brain areas of ALFF differences between the RW and SD group. Coordinates x, y, z  
 530 (mm) are given in standard stereotactic MNI space. All regions listed are statistically significant  
 531 at the  $p < 0.05$ , AlphaSim corrected. L: left; R: right.

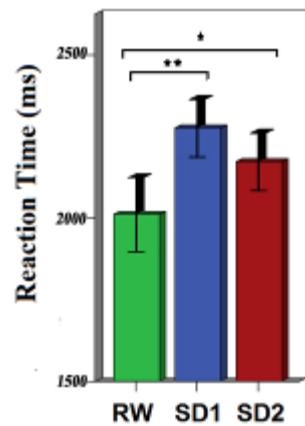
532  
 533 SD1:  
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Brain regions	MNI coordinates			BA	L/R	Voxels	T values
	x	y	z				
Superior Frontal Gyrus	-12	66	6	10	L	202	-4.27
Middle Frontal Gyrus	45	27	30	46	R	47	-3.62
Middle Frontal Gyrus	-45	39	-6	46/47	L	47	-4.03
Inferior Frontal Gyrus	54	18	0	22/47	R	82	-4.01
Middle Occipital Gyrus	-51	-66	-15	19/37	L	653	4.66
Middle Occipital Gyrus	42	-60	-9	19	R	109	4.35
Middle Occipital Gyrus	-12	-72	0	18/19	L	101	3.99
Thalamus	21	-15	12	-	R	98	4.37
Thalamus	-18	-18	3	-	L	40	4.19
Inferior Parietal Lobule	45	-60	33	39/40	R	148	-5.48
Precuneus/ Posterior Cingulate	3	-63	30	31/7	R	70	-5.58
Precentral Gyrus	-36	-9	60	1/2/3/4/6	L	738	7.32
Precentral Gyrus	-54	-3	36	3/4/6	L	41	4.14

535  
 536 SD2:

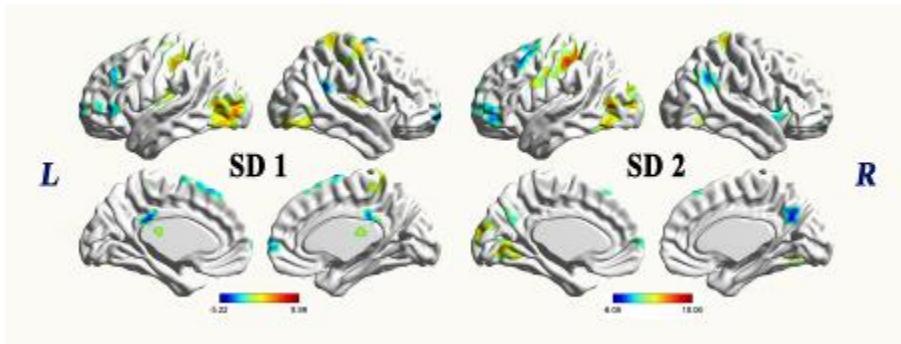
Brain regions	MNI coordinates			BA	L/R	Voxels	T values
	x	y	z				
Medial Frontal Gyrus	15	66	-3	11/10	R	54	-5.22
Superior Frontal Gyrus	-42	48	0	10/46	L	39	-4.62
Middle Frontal Gyrus	-51	33	27	9/46	L	40	-5.01
Inferior Frontal Gyrus	-51	36	0	10/47	L	62	-4.62
Insula	-33	-18	21	13	L	378	8.99
Insula	36	-15	21	13	R	56	4.67
Post Cingulate Gyrus	0	-33	33	23/31	L	30	-4.51
Inferior Parietal Lobule	66	-48	24	39/40	R	156	-6.09
Precentral Gyrus	36	-24	36	2/3/4/6	R	319	6.51
Precentral Gyrus	-36	-12	57	1/2/3/4/6	L	652	10.06
Middle Occipital Gyrus	-39	-87	0	18/19	L	413	6.79
Medial Frontal Gyrus	15	66	-3	11/10	R	54	-5.22
Superior Frontal Gyrus	-42	48	0	11/46	L	39	-4.62

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539 **Figure Legends**

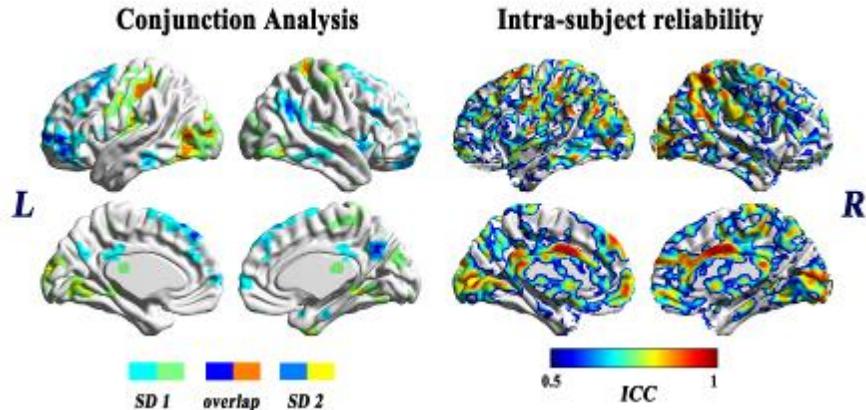
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541 **Figure 1. Effects of 24h sleep deprivation on RT for semantic tasks.** Y-axes show the mean  
 542 ( $\pm 2$  sd) time of RT for each group. X-axes indicate the group. Significantly different (\* $p < 0.05$ ,  
 543 \*\* $p < 0.01$ ) groups are as indicated.



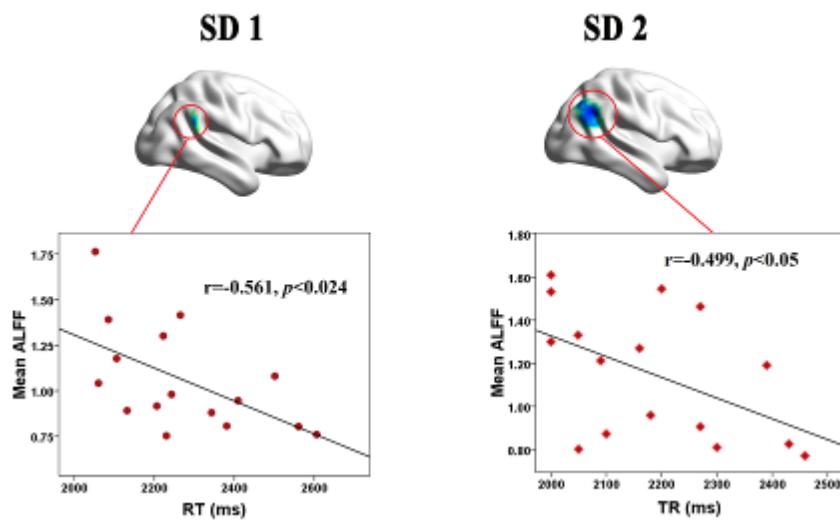
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545 **Figure 2: Group ALFF differences in the two SD sessions.** The effects are significant at  $p <$   
 546 0.05, AlphaSim corrected. Cool color indicates that the SD group had decreased ALFF compared  
 547 with the controls and the hot color indicates the opposite. The results were visualized with the  
 548 BrainNet Viewer (<http://www.nitrc.org/projects/bnv/>).



549

550 **Figure 3: Overlap of SD1 and SD2 compared to control differences.** 2 SD sessions shared the  
 551 same areas are shown in brown and blue. **Voxel-wise ICC.** The intra-subject test-retest reliability  
 552 for two SD sessions, the regions with high reliability ( $ICC > 0.5$ ) are shown. The results were  
 553 visualized with the BrainNet Viewer (<http://www.nitrc.org/projects/bnv/>).



554

555 **Figure 4: The correlation between RTs and ALFF change in the right IPL in the sleep**  
 556 **deprivation group.** The greater the prolongations in RT from rest to sleep deprivation, the  
 557 greater the decrease in ALFF in the right IPL. The results were visualized with the BrainNet  
 558 Viewer (<http://www.nitrc.org/projects/bnv/>).

559